

# Training a Deep Feedforward Network

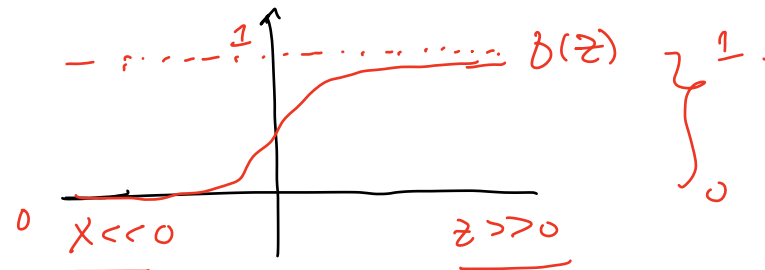
## Forward pass and Backpropagation

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See Powerpoint slides.

# Practical issues

$$a = \frac{1}{1+e^{-z}}$$



Which activation function to use?

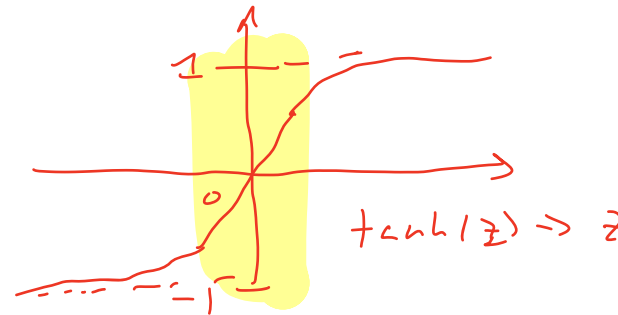
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↳ good for some output activation

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- ▶ tanh( $z$ ): similar to identity function near 0, resembles a linear model when activation is small, performs better than sigmoid. ( $\tanh(0) = 0, \sigma(0) = \frac{1}{2}$ ).



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- ▶ ReLU( $z$ ): easy to optimize (6 times faster than sigmoid), often used with affine transformation  $g(W^T x + b)$ . Derivative is 1 whenever the unit is active.



Sigmoidal activation functions are often preferred than piecewise linear activation functions in non-feed forward networks. e.g. probabilistic models, RNNs etc

# Additional resources

Deep neural network is a relative young field with lots of empirical results. Read more on the practical things to do for building and training neural networks:

- ▶ Stanford Class on Convolutional Neural Networks:  
<http://cs231n.github.io>
- ▶ Ian Goodfellow, Yoshua Bengio and Aaron Courville, *Deep Learning*, MIT Press, 2016

Demos:

- ▶ <http://vision.stanford.edu/teaching/cs231n-demos/linear-classify/>
- ▶ <https://playground.tensorflow.org/>